# Common Variants Coregulate Expression of *GBA* and Modifier Genes to Delay Parkinson's Disease Onset

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**ABSTRACT: Background:** *GBA* mutations are numerically the most significant genetic risk factor for Parkinson's disease (PD), yet these mutations have low penetrance, suggesting additional mechanisms.

**Objectives:** The objective of this study was to determine if the penetrance of *GBA* in PD can be explained by regulatory effects on *GBA* and modifier genes.

**Methods:** Genetic variants associated with the regulation of *GBA* were identified by screening 128 common single nucleotide polymorphisms (SNPs) in the *GBA* locus for spatial *cis*-expression quantitative trail locus (supported by chromatin interactions).

**Results:** We identified common noncoding SNPs within *GBA* that (1) regulate GBA expression in peripheral tissues, some of which display  $\alpha$ -synuclein pathology and (2) coregulate potential modifier genes in the central nervous system and/or peripheral tissues. Haplotypes based on 3 of these SNPs delay disease onset by 5 years. In addition, SNPs on 6 separate chromosomes coregulate

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Published online 18 June 2020 in Wiley Online Library (wileyonlinelibrary.com). DOI: 10.1002/mds.28144 *GBA* expression specifically in either the substantia nigra or cortex, and their combined effect potentially modulates motor and cognitive symptoms, respectively.

Conclusions: This work provides a new perspective on the haplotype-specific effects of GBA and the genetic etiology of PD, expanding the role of GBA from the gene encoding the β-glucocerebrosidase (GCase) to that of a central regulator and modifier of PD onset, with GBA expression itself subject to distant regulation. Some idiopathic patients might possess insufficient GBA-encoded GCase activity in the substantia nigra as the result of distant regulatory variants and therefore might benefit from GBA-targeting therapeutics. The SNPs' regulatory impacts provide a plausible explanation for the variable phenotypes also observed in GBA-centric Gaucher's disease and dementia with Lewy bodies. © 2020 The Authors. Movement Disorders published by Wiley Periodicals. LLC on behalf of International Parkinson and Movement Disorder Society.

Parkinson's disease (PD) is a progressive neurodegenerative condition pathologically characterized by the presence of  $\alpha$ -synuclein ( $\alpha$ syn) containing Lewy bodies.<sup>1-3</sup> The defining motor symptoms of PD are associated with the loss of dopaminergic neurons in the substantia nigra, but patients can also suffer numerous nonmotor symptoms that include cognitive impairment. The disease affects more than 7 million individuals worldwide,<sup>4,5</sup> and the rising incidence of PD will increase the burden of this incurable disease on healthcare systems.<sup>6</sup> The current therapy for PD provides only symptomatic relief with no therapeutics demonstrated to attenuate disease progression. although the potential for drug discovery and/or repurposing is increasing as research continues to elucidate the pathways underlying PD pathogenesis.7-10 PD is predominantly considered an idiopathic disease, but recent studies support a much stronger influence of genetic determinants in the idiopathic cases of PD (10%-30% heritability).<sup>11,12</sup> Among the ~90 genetic loci associated with PD, the GBA locus is the most common genetic risk factor with mutations in 2.3% to 9.4% (11%-31% in Ashkenazi Jews) of PD cases,<sup>13</sup> with ethnicity playing a large role in determining the risk range.<sup>14</sup> However, the estimated lifetime risk ratio of a GBA mutant carrier developing PD is only 21% to 29%, consistent with the variable penetrance of the *GBA* coding variants.<sup>15,16</sup> Furthermore, recent observations identified reduced GBA-encoded protein, β-glucocerebrosidase (GCase) activity in patients with idiopathic PD (IPD) in the absence of loss-of-function (LoF) *GBA* mutations.<sup>17-19</sup> Collectively, these observations are consistent with regulatory impacts on GBA expression and other modifier genes contributing to PD development.

Cognitive decline is among the most frequent and debilitating nonmotor symptoms of patients with PD with 46% and 83% of surviving patients, at 10 and 20 years postdiagnosis, respectively, having progressed to dementia (PD dementia [PDD]).<sup>20,21</sup> Notably, patients who carry *GBA* mutations display higher frequencies of cognitive decline and 5 times the risk of progression to dementia relative to patients who do not have *GBA* mutations.<sup>22-25</sup> Postmortem studies indicate that cortical Lewy body pathology is a main pathological correlate of dementia in PD.<sup>26</sup>

Heterozygote *GBA* coding mutations are also a significant risk factor for dementia with Lewy bodies (DLB; odds ratio > 8), a disease that correlates closely with PDD but in which cognitive symptoms precede or coincide with motor deficits.<sup>27</sup> As with PD, *GBA* mutations display incomplete penetrance in DLB for unknown reasons.<sup>28</sup>

*GBA* mutations are also the basis of Gaucher disease, an autosomal recessive disorder that can present with nonneurological or neuropathic forms. Genotype–phenotype studies reveal limited correlation; patients possessing the same *GBA* mutation present with different phenotypes, whereas clinically similar patients possess a diverse range of mutations.<sup>29</sup> This phenotypic variation among Gaucher patients sharing the same *GBA* genotype further implicates the role of modifiers that could include *GBA* variants modulating *GBA* expression and/or potential modifier genes.<sup>29</sup>

Here we undertook an in-depth characterization of the regulatory control of *GBA* and the identification of potential modifier genes. To identify the regulatory network responsible, we interrogated the GBA locus for regulatory interactions modulating expression of GBA and/or potential modifier genes. Our findings identified GBA expression as being regulated by cis elements (tagged by 56 single nucleotide polymorphisms [SNPs]) in tissues excluding the brain. Notably, 73 SNPs located within *GBA* affected the expression levels of 143 potential modifier genes. In contrast, GBA expression in the substantia nigra and cortex was regulated in trans from other chromosomes. Cohort analyses confirmed that individuals with minor allele variants at noncoding regulatory positions within GBA have a significant correlation with PD symptom onset and diagnosis. These observations reveal a genomewide regulatory network for GBA, providing insights into the mechanisms underlying the variable phenotypes and incomplete penetrance observed in patients with PD.

# Methods

#### Variant Selection

We selected all common SNPs within the *GBA* locus chr1:155204239-155214653 (dbSNP build151, appear in at least 1% of the global population). We added 1 rare SNP (rs2230288) in the coding region of *GBA* (chr1:155204239-155214653) because it had a known *cis*-expression quantitative trail locus (eQTL) with *GBA* in the Genotype-Tissue Expression (GTEx) project (Supplementary Fig. 1). Genomic positions of SNPs are reported for human reference hg19.

#### Identification of SNP-Gene Spatial Relationships in the *GBA* Locus

For all SNPs in the *GBA* locus, putative spatial regulatory connections were identified. We used the contextualize developmental SNPs using 3D information (CoDeS3D) algorithm<sup>30</sup> (https://github.com/Genome3d/ codes3d-v1; Supplementary Fig. 1) to integrate both spatial interaction (Hi-C data) plus expression data (eQTL) to identify genes whose transcript levels depend on the identity of the SNP (ie, spatial eQTL).<sup>30,31</sup>

Hi-C captures the spatial organization of chromatin by identifying regions of the genome that are physically associated and can therefore be covalently connected by a cross-linking agent.<sup>32</sup> Such spatial connections were identified from previously generated Hi-C libraries of various origins (Supplementary Table 1): (1) cell lines GM12878, HMEC, HUVEC, IMR90, K562, KBM7, HELA, NHEK, and hESC (gene expression omnibus [GEO] accession numbers GSE63525,<sup>33</sup> GSE43070,<sup>34</sup> and GSE35156<sup>35</sup>); (2) tissue-specific data from the encyclopedia of DNA elements (ENCODE) sourced from the adrenal gland, bladder, dorsolateral prefrontal cortex, hippocampus, lung, ovary, pancreas, psoas muscle, right ventricle, small bowel, and spleen (GSE87112)<sup>36</sup>; and (3) tissues of neural origin from the cortical and germinal plate neurons (GSE77565),<sup>37</sup> cerebellar astrocytes, brain vascular pericytes, brain microendothelial cells, SK-N-MC vascular human neuroblastoma cell line, spinal cord astrocytes (GSE105194, GSE105513, GSE105544, GSE105914, GSE105957),<sup>38</sup> neuronal and progenitor cells (GSE52457).<sup>39</sup>

To identify SNP locations in the Hi-C data, all possible Hi-C fragment locations were identified through digital digestion of the hg19 reference genome (matching the restriction enzyme from the Hi-C libraries MboI or HindIII). First, we mapped SNPs to genome fragments (ie, SNP fragment). Next, all SNP fragments were queried against the Hi-C databases to identify distal fragments of DNA that spatially connect to the SNP fragment. If the distal fragment contained the coding region of a gene, a SNP–gene spatial connection was confirmed. There was no binning or padding around restriction fragments to obtain gene overlap.

#### Confirmation of SNP–Gene Regulatory Relationships in the *GBA* Locus

Spatial SNP-gene pairs were queried in the genotypetissue expression (GTEx) database (www.gtexportal. org, version 7<sup>40</sup>) to identify spatial SNP-gene pairs with significant eQTLs (both *cis*-acting and *trans*-acting eQTL; false discovery rate (FDR) adjusted P < 0.05; Supplementary Fig. 1). Because of the tissue specificity of the GTEx database, it is possible to assign tissue specificity to the transcription changes.

#### Genome-Wide Search for Distant Regulators of GBA Transcription

We performed a genome-wide search of all 31,471,836 SNPs in dbSNP151 (as available in GTEx

version  $7^{40}$ ) for an association with *GBA* transcription (Supplementary Fig. 1). All SNPs suggestive of genomewide significance ( $P < 1 \times 10 - 6$ ) were also tested with the CoDeS3D<sup>30</sup> algorithm to discover which other genes might be coregulated by the same SNPs.

#### Gene Ontology, Pathway Analysis, and Functional Prediction

To identify overlapping biochemical functions and pathways, we queried the KEGG Pathway Database (https://www.kegg.jp/kegg/pathway.html). We used all genes identified as associating with the *GBA* locus, forming significant first-level and second-level pathway maps. We identified drugs that target the genes and drug mechanisms (Drug Gene Interaction database).

All identified genes were searched for known PD associations in the literature by Boolean searches of the literature databases (ie, Medline, EMBASE, Scopus, and Web of Science) using "[gene name] and Parkinson's," "[gene name] and *GBA*," or "[gene name] and alpha-synuclein" as search terms.

#### Haplotype Analyses

Variants in the GBA locus from 229 patients with PD (Table 1) were identified by Nanopore sequencing and confirmed via Sanger sequencing as previously described.<sup>41</sup> In summary, FASTQ reads with a quality score (qscore) <7 were removed from the analysis. Porechop version 0.2.4 (https://github.com/rrwick/ Porechop) was used to remove sequencing adapters and to demultiplex the reads. The reads were aligned against the genome reference consortium human build 38 (GRCh38) human reference genome using Minimap2 version 2.16 (https://lh3.github.io/minimap2/). Variant calling was performed using Nanopolish version 0.11.1 (default parameters; https://github.com/jts/ nanopolish). Haplotypes were phased with WhatsHap

**TABLE 1.** Demographic and clinical data for the Parkinson's disease patients in the New Zealand Brain Research Institute (NZBRI) cohort separated by *GBA* mutation status

| Cohort Characteristic              | Known GBA Mutation       | No Known GBA Mutation    | P Value |
|------------------------------------|--------------------------|--------------------------|---------|
| n                                  | 21                       | 208                      |         |
| Sex (% male)                       | 71                       | 67.3                     | 0.81    |
| Education, y                       | 13.3 (3.1)               | 12.8 (2.6)               | 0.41    |
| Follow-up duration, y              | 5.8 (3.6)                | 5.1 (3.6)                | 0.397   |
| Symptom onset age, y               | 58.3 (9.2)               | 60.7 (8.5)               | 0.222   |
| Diagnosis age, y                   | 60.1 (9.1)               | 62.6 (8.5)               | 0.203   |
| Disease duration, y                | 15.2 (6.9)               | 13.7 (5.8)               | 0.268   |
| Age at death, y                    | 76.3 (8.4)               | 78.3 (6.1)               | 0.169   |
| Age at dementia, y                 | 71.3 (5.7)               | 74.8 (5.8)               | 0.117   |
| Disease duration until dementia, y | 10.8 (4.6)               | 10.0 (4.1)               | 0.627   |
| Dementia, %                        | 42.9 (95% Cl, 24.6-63.5) | 20.2 (95% Cl, 15.3–26.2) | 0.026   |

Values are mean (standard deviation) unless otherwise stated. Patients met the UK Brain Bank criteria for Parkinson's disease and were excluded as outlined in Graham et al.<sup>41</sup> Reprinted with permission from *Parkinsonism & Related Disorders* 2020;70:36–41, © 2019 Elsevier Ltd. Abbreviation: Cl, confidence interval.

version 0.18<sup>42</sup> (default parameters), and haplotypes were determined using the haplotypes version 1.1 R package (R Foundation for Statistical Computing, Vienna, Austria). The 55 haplotypes identified and other clinical outcomes were used for further analysis. Haplotypes were then sorted into clusters A and B by genotypes (Euclidean distance, Ward clustering). Individuals were then assigned to a haplotype group based on the identity of their 2 haplotypes (homozygous haplotype cluster A, heterozygous, or homozygous haplotype cluster B). We regressed haplotype groups against phenotypic measures of IPD, assuming that haplotype relates to phenotype as an additive model (haplotype dosage effect). The additive model defines the effect of haplotype allele count, where the effect on phenotype is a linear combination of the haplotypes (the phenotype of heterozygous haplotype alleles is between the homozygous effect sizes).

### **Results**

#### Genetic Variants at the GBA Locus Regulate GBA Expression in Peripheral Tissues

The substantial incomplete penetrance of GBA mutations motivated us to identify genetic variants at the GBA locus that regulate GBA expression in human tissues, including 10 brain regions. Genetic variants that are associated with regulation of GBA were identified by screening 128 common SNPs located within the GBA locus for spatial eQTLs using CoDeS3D<sup>30</sup> (Fig. 1A, Supplementary Fig. 1). The CoDeS3D<sup>30</sup> algorithm tests for spatial eQTLs (GTEx database) that are supported by chromatin interactions (Hi-C data), linking the common SNPs in the GBA locus with genes in cis (< 1 Mb between the SNP and gene). Of the 128 common SNPs, 56 (44%) tested were identified as cisacting spatial eQTLs that were associated with decreased GBA expression in 14 of 29 peripheral tissue types (Fig. 1B, green; Supplementary Table 2). Blood was the single exception, where the *cis*-acting spatial eOTLs were associated with an increase in GBA expression (Fig. 1B). The GBA pseudogene GBAP1 was also subject to cis-acting spatial eQTLs and typically displayed the same response as GBA except in the blood and in the brain where GBAP1 remained subject to *cis*-acting regulation.

# Genetic Variants at the *GBA* Locus Regulate the Expression of Potential Modifier Genes

The 128 common SNPs at the *GBA* locus were then examined for their ability to regulate other genes, some of which might modify the *GBA* phenotype. In addition to *cis*-acting spatial eQTLs, the CoDeS3D<sup>30</sup> algorithm also detects *trans*-acting spatial eQTLs (>1 Mb between the SNP and gene on the same chromosome, or the

SNP and gene are on different chromosomes). In total, 73 SNPs regulate 143 potential modifier genes across many tissues (Fig. 2, Supplementary Fig. 2a). The ratio of cis-connections to trans-connections (4654: 288) we detected agrees with observations that long-distance (trans-acting) connections are less prevalent but more tissue-specific than short-range (cis-acting) connections.43-45 The effect sizes of these spatial eQTLs vary largely by tissue as well as distance of connection (Fig. 3A). We additionally analyzed the 73 SNPs for transcription factor binding sites and enhancer/promoter markers using Haploreg version 4.1 ((https:// pubs.broadinstitute.org/mammals/haploreg/haploreg. php). Notably, 38% (28 of 73) and 71% (52 of 73) of these SNPs display histone marks associated with promoter and enhancer activity, respectively (Supplementary Table 3).

#### Modifier Genes Are Enriched for PD Relevance That Include Synaptic Vesicle Formation and Recycling

We hypothesized that if the cis-acting and trans-acting spatial eQTLs (centered on GBA) control modifier genes, then these genes should be epistatic with their products acting in the same or complementary pathways to the GBA-encoded GCase. Therefore, we performed pathway analyses and literature data mining on the 143 potential modifier genes. Collectively, these analyses revealed that 24% (n = 35) of the potential modifier genes have an association with PD or a related pathway (Supplementary Fig. 2b, Supplementary Table 4). Of these genes, 4 (DNAJC6 [PARK19], SYT11, SNAP91 [AP180], EPS15) showed enrichment involving synaptic vesicle formation and recycling, with DNAJC6 and SYT11 previously associated with PD.<sup>46-</sup> <sup>50</sup> Nine genes had known neuronal functions (Supplementary Table 4), and notably 23% (33 of 143) of the modifier genes were identified as being druggable targets (Supplementary Table 5).

Changes in the expression of mutationally constrained genes are likely to have a higher impact on fundamental disease processes than those that are not highly constrained.<sup>51</sup> As such, the activity of genes that are intolerant to loss-of-function (LoF) mutations are more likely to be altered by changes to gene expression. In PD, it has been reported that there is a significant enrichment of heritability in LoF-intolerant genes across almost all cell-type classes.<sup>52</sup> Therefore, we compared our cis-acting and trans-acting eQTL gene lists for enrichment for LoF intolerance (Supplementary Fig. 3a, b; intolerance defined as probability of being loss-offunction intolerant (pLI)  $\ge 0.9$ ).<sup>53</sup> Comparing the gene set that is not regulated by variants within the GBA locus with the gene sets that are affected by cis-eQTLs or trans-eQTLs from variants inside GBA, a pattern of



**FIG. 1.** *GBA* is subject to tissue-specific *cis* acting spatial regulation. (**A**) The *GBA* locus (*GBA* GENCODE coding region  $\pm$  20 kb on either side) contains 128 common SNPs (green lines); 57% (73) have significant SNP-gene associations to either/both local genes in 1q21 as well as genes across many other chromosome (purple lines; Supplementary Table 2, Supplementary Figure 2a), and 44% (56) have significant eQTLs with *GBA* (pink lines). (**B**) SNPs within the *GBA* locus have a varied effect on the expression of *GBA* (green) and the pseudogene *GBAP1* (orange). Previous findings in *GBA* have noted a strong downregulation of *GBA* in disease pathways, which is consistent with the findings here that most *GBA* locus variants downregulate both *GBA* and *GBAP1*. However, blood is an exception. eQTL, expression quantitative trail locus; SNPs, single nucleotide polymorphisms. [Color figure can be viewed at wileyonlinelibrary.com]

intolerance emerges. eQTLs at longer distances, on average, connect to a higher proportion of LoF-intolerant genes. Those eQTLs connecting to genes outside of *GBA* containing chromosome 1 were even more biased toward intolerance, with a much larger proportion of genes with pLI > 0.9. To test for a threshold effect, we also looked for median pLI for each gene list, which is also much larger (0.83) for the longest (*trans*-interchromosomal) connections than for the other gene lists (median pLI < 0.1 for all other lists). These results are consistent with the *trans*-eQTLs we identified as being important for PD.

#### GBA Haplotypes Stratify Idiopathic Patients by Age of Symptom Onset and Diagnosis

To assess the clinical impact of the *cis*-acting eQTLs, we hypothesized that the pleiotropic effects of GBA locus SNPs may be explained by the combined action of these eQTLs as a haplotype. To test this, targeted

Nanopore sequencing (all exons and introns of GBA on 8.9 kb amplicons) on a cohort of 229 patients with PD<sup>41</sup> was performed, resulting in the identification of 55 individual haplotypes (Supplementary Tables 6 and 7). We then clustered the haplotypes into 2 haplotype clusters (Supplementary Fig. 4; haplotype cluster A = minor/alternative alleles, haplotype clusterB = majority/reference alleles). To distinguish the effect of missense mutation carriers from the idiopathic cases, we removed from further analysis individuals containing GBA coding mutations known to alter GBA/ GCase function (rs2230288 [E365K], rs75548401 rs147138516 [D179H], [T408M], rs76763715 [N409S], rs146774384 [R78C], novel subvariant [L335]), leaving 208 patients with IPD (Supplementary Fig. 4, Supplementary Table 7).

Individuals were then organized into haplotype groups according to whether they were homozygous or heterozygous for haplotype cluster alleles. A total of 26 individuals were classified as haplotype group 1 as they



**FIG. 2.** Single nucleotide polymorphisms within *GBA* are associated with tissue-specific patterns of modifier gene expression. Single nucleotide polymorphisms within *GBA* are physically and functionally associated with the expression levels of 143 modifier genes across the 47 tissues. For example, single nucleotide polymorphisms in *GBA* form *trans*-expression quantitative trail locus connections to *AGAP1* (100 Mb away from *GBA* on chromosome 1) and *EPS15* (chromosome 2) in the substantia nigra, both of which have strong neurodevelopmental-relevant functions. Red, upregulated (normalized effect size is positive); blue, downregulated (normalized effect size is negative). [Color figure can be viewed at wileyonlinelibrary.com]

were homozygous for alleles from haplotype cluster A (minor/alternative genotype alleles; Supplementary Fig. 4, Supplementary Table 7); 67 individuals were heterozygous (ie, 1 allele from each of haplotype clusters A and B) and classified as haplotype group 2. A total of 115 individuals were homozygous for haplotype cluster B (majority/reference alleles) and were classified in haplotype group 3 (Supplementary Fig. 4, Supplementary Table 7). We regressed haplotype groups against phenotypic measures of PD to determine if there was an association with clinical outcomes (Supplementary Table 8). We identified that symptom onset age and diagnosis age (highly collinear variables) were significantly correlated to haplotype groups (r = 0.18, P < 0.01; Fig. 3B, Supplementary Fig. 5) and that haplotype group 1 (predominantly SNP minor/alternative genotype alleles) had a mean diagnosis age 5.7 later than group 3 (Fig. 3B). The 3 SNPs (rs9628662, rs762488, rs2009578) within the haplotype that we identified as spatial eQTLs modulate peripheral *GBA* expression and the expression of potential modifier genes in either the brain and/or periphery (Supplementary Table 2).

#### Distant Loci Regulate GBA Expression in the Substantia Nigra and Cortex

*GBA* expression in the substantia nigra was not associated with *cis*-acting eQTLs (Fig. 2). However, *trans*acting eQTLs (SNPs associated with the expression of genes >1 Mb away or on other chromosomes) better identify regulatory networks, associated transcription



**FIG. 3.** SNPs impact modifier gene expression and Parkinson's disease symptom onset and diagnosis age. (**A**) The distribution of normalised effect size for expression quantitative trail locus from SNPs within the *GBA* locus across the 47 the Genotype-Tissue Expression (GTEx) project tissue types. (**B**) Parkinson's disease symptom onset age and (**C**) diagnosis age were significantly correlated to haplotype groups (r = 0.21 for onset and r = 0.23 for diagnosis, P < 0.01). Symptom onset and diagnosis age are highly collinear variables, and each show a decrease in mean (white) and median (black) age across the haplotype groups. SNPs, single nucleotide polymorphisms. [Color figure can be viewed at wileyonlinelibrary.com]

factors, and tissue-specific gene regulation.<sup>43-45</sup> Therefore, we undertook a genome-wide search (using 31,471,836 SNPs) to identify *trans*-acting eQTLs that regulate *GBA* expression in PD-relevant brain tissues (substantia nigra and cortex) and the cerebellum, which is not strongly associated with PD (Supplementary

Table 9, Supplementary Fig. 1). We used the genomewide association study-derived threshold for common variants (minor allele frequency (MAF) > 5%) with exome-wide significance ( $P < 1 \times 10^{-6}$ ) for the identification of *trans*-acting eQTLs because we were looking solely for regulatory impacts on *GBA* expression.<sup>54</sup> We

| Distal regulatory variants    | Chr. | Effect on GBA mRNA in SN | Effect on GBA mRNA in Cortex | Regulatory Variant Gene | Location   |
|-------------------------------|------|--------------------------|------------------------------|-------------------------|------------|
| rs4328731 + 13 other variants | 22   | Ļ                        |                              | ELFN2                   | Intronic   |
| rs2446914                     | 8    | 1                        |                              | RGS22                   | Intronic   |
| rs748178, rs736333, rs92481   | 3    |                          | Ļ                            | 8kb 5' of RP11-62G11.2  | Intergenic |
| rs4781974                     | 16   |                          | Ļ                            | 17kb 5' of XYLT1        | Intergenic |
| rs117360313                   | 6    |                          | <b>↑</b>                     | GPRC6A                  | Intronic   |
| rs77317045                    | 10   |                          | $\dot{\uparrow}$             | ZNF365                  | Intronic   |

TABLE 2. Regulatory effect of variants located throughout the genome on GBA mRNA in the SN and cortex

Expression is: ↓, downregulated; ↑, upregulated. *GBA* is located on Chr 1. Abbreviations: Chr., chromosome; SN, substantia nigra.

identified significant ( $P < 1 \times 10^{-6}$ ) distal SNP-gene associations for 4 loci in the cortex, 2 loci in the substantia nigra, and 0 loci in cerebellum (Supplementary Table 9). Notably, the 6 loci containing these *trans*-acting eQTLs are on different chromosomes from each other and *GBA*, eliminating any case for their common action on *GBA* expression being through correlation of effects in linkage disequilibrium (Table 2). Further to this, the vast majority of the eQTLs at these loci display transcription factor binding sites as well as histone marks associated with enhancer activity (Supplementary Table 8). Finally, CoDeS3D<sup>30</sup> analysis identified the regulatory effect associated with the variants on chromosome 22 on *GBA* expression to be specific to the substantia nigra (Supplementary Table 10).

#### Discussion

We provided evidence that expands the role of the GBA locus to include its action as a hub of regulatory activity of importance to PD onset. We have demonstrated that the impact on GBA is not limited to missense mutations (eg, N370S, E326K, V394L, L444P) that directly impact the protein structure of the GCase but additionally include common noncoding variants that regulate its expression. GBA expression is significantly modulated by both *cis*-acting eQTLs from within the GBA locus as well as by trans-acting regulation from loci on different chromosomes. The regulation by cis-acting spatial eOTLs modulates GBA expression in 14 peripheral tissues (including the heart, esophagus, stomach, pancreas, and salivary and adrenal glands), but not in the brain. Although peripheral, these tissues are highly regulated and innervated by the autonomic and enteric nervous systems, which are tightly associated with the brain. Reductions in GBA expression/ GCase levels are inversely related to the accumulation of asyn in Lewy body inclusions,<sup>55</sup> and intriguingly, 5 of these peripheral tissues with spatial eQTLs decreasing GBA expression have to date been found to contain  $\alpha$  syn pathology in patients with PD (Supplementary Table 11).

We contend that reduced *GBA* expression in specific peripheral tissues renders them susceptible to  $\alpha$ syn accumulation and deposition in these tissues and may contribute to some of the nonmotor symptoms experienced by patients (eg, orthostatic hypotension, gastrointestinal dysregulation), thereby supporting the view of PD as a multisystem disorder. Furthermore, we speculate that this  $\alpha$ syn pathology in peripheral tissues (eg, stomach) may additionally contribute to the proposed gut-to-brain transmission of pathogenic  $\alpha$ syn observed in animal models.<sup>56,57</sup> Finally, an examination of these peripheral tissues may identify accessible peripheral tissues relevant to disease pathogenesis, potentiating early disease detection and therapy development.

The *cis*-acting spatial eQTLs were also found to regulate 143 genes, including genes with published connections to PD. Some of these genes might modulate the disease process and progression as the 3 noncoding cis SNPs (rs9628662, rs762488, rs2009578) within the GBA locus form a haplotype that is significantly correlated with age of symptom onset and the age at diagnosis. Individuals who are homozygous for minor/ alternate genotype alleles display a  $\sim$  5-year delay of symptom onset and diagnosis, while heterozygous individuals show an intermediate degree of disease delay ( $\sim$ 2.9 years for onset and 2.4 years for diagnosis), suggestive of a transcriptional dose-effect (Fig. 3B). Surprisingly, despite acting as spatial eQTLs, these SNPs do not regulate GBA expression in the brain. However, they do modulate the expression of other genes within the brain that include DNAJC6 [PARK19], MSTO1, NF1, PRKG1, RANBP3, RUSC1-AS1, S100A1, THBS3 (Supplementary Table 2), some of which are PD associated (Supplementary Table 4). Moreover, these spatial eQTLs also regulate expression of GBA and other genes in peripheral tissues (Fig. 2). Therefore, the mechanism of the haplotype-specific delayed disease onset/diagnosis could result from (1) altered expression of potential modifier genes in the central nervous system and/or peripheral tissues, (2) increased GBA expression in the blood, (3) decreased GBA expression in peripheral tissues other than blood, or (4) a combination of these.

The trans regulation of GBA expression in the brain was discovered by a genome-wide search that identified significant distal SNP-GBA associations for 2 loci in the substantia nigra and 4 loci in the cortex (3 SNPs increased GBA expression, 3 SNPs decreased GBA expression; Table 2), with the 6 loci located on different chromosomes. We propose that the independent assortment of these common variants could produce variant combinations whose resulting spectrum of GBA expression levels in the substantia nigra or cortex significantly contributes to the variable motor and cognitive phenotypes of PD. For example, in GBA carriers, the coinheritance of common variants that enhance the expression of GBA could mitigate the phenotypic consequences of GBA mutations that reduce lysosomal GCase activity. Such circumstances could contribute to the incomplete penetrance of GBA mutations in which the majority of people who carry GBA mutations do not develop PD by the age of 80.<sup>15</sup> The reverse would also be true with trans-acting regulatory variants decreasing GBA expression in the substantia nigra or cortex and potentially exacerbating motor or cognition/ dementia symptoms, respectively, in carriers of GBA mutations. Therefore, we contend that GBA expression is a key variable that on its own begins to explain the incomplete or reduced penetrance of GBA mutations.

Idiopathic patients lacking GBA mutations display reduced GBA expression and GCase activity in the substantia nigra for unknown reasons.<sup>18,19</sup> The common trans-acting variants regulating GBA expression in this tissue are strong candidates to also account for this occurrence in that such patients might possess variants decreasing GBA expression. This observation raises the possibility of genotyping patients with IPD for these trans-acting regulatory variants. This would enable identification and stratification of patients lacking GBA mutations but whose GBA locus regulatory variant combination is predicted to confer a significant decrease in GBA expression in the substantia nigra or cortex, which in turn may have distinct clinical features, an aspect we are currently investigating in patient whole genome sequence (WGS)-clinical datasets. The subset of idiopathic patients with reduced GBA expression may benefit from therapeutics that increase GCase activity, including ambroxol, which has entered clinical testing because of its capability to improve function of GCase.<sup>58,59</sup>

Looking beyond the implications of *GBA* in PD, mutations at this loci are also a major risk for the synucleinopathy DLB (odds ratio, 8.28).<sup>27</sup> The clinical distinction between DLB and PDD is the relative onset timing of motor and cognitive symptoms. We have identified *trans*-acting regulatory variants that independently affect *GBA* expression in either the substantia

nigra or cortex, which are brain regions associated with motor and cognitive functions, respectively. Therefore, it is tempting to speculate on the relative contributions of these variants in modulating the sequence of motor or cognitive decline in some individuals. Interestingly, the *cis GBA* regulatory variants may also contribute to DLB as  $\alpha$ syn pathology is also observed in the peripheral tissues of DLB patients (Supplementary Table 11).

Mutations in *GBA* are causal for Gaucher disease, a potentially devastating disease that can impact the brain and peripheral tissues. Gaucher disease displays incomplete penetrance and significant variability in genotype–phenotype correlations. The factors that influence the tissues affected (central nervous system vs. peripheral), disease severity, or progression within particular genotypes are unknown. We contend the *cis*-acting and *trans*-acting eQTLs that we identified as regulating *GBA* and modifier gene(s) expression are excellent candidates to explain the phenotypic variability that is observed in Gaucher disease.

Our analyses identified a number of *cis*-acting variants regulating GBA expression in many bodily tissues, yet these spatial eQTLs are not active within the substantia nigra or cortex. This is an intriguing and unexpected finding given the conventional view that PD is a disorder of the brain. One may speculate that the high regulatory activity of GBA eQTLs on modifier genes may be dampening the capacity for simultaneous transcription, thereby reducing the activity of such cis-acting eOTLs within the brain. Interestingly, other genes known to have a strong tissue-specific disease presentation, such as BRCA1 (72% of women who inherit a harmful BRCA1 mutation develop breast cancer by the age of 80<sup>60</sup>) also lack significant *cis*-acting eQTLs in GTEx within the relevant (ie, breast) tissue. Genomewide association study (GWAS) SNP rs1799949, the only GWAS SNP mapped to BRCA1 and in GTEx, has significant eQTLs for BRCA1 in the liver, tibial artery, and esophagus. Rs1799949 is also linked to a GWAS study of menopause, not breast cancer susceptibility. It should also be noted here that the haplotype cohort, the Hi-C cohort, and GTEx libraries are separate and nonhomogenous sources (cell lines and 2-3 different sources of tissues), with large age and gender differences between the Hi-C and GTEx data. Despite this, the *cis*-acting and a limited number of *trans*-acting spatial eQTLs were supported by Hi-C connections derived from neuronal-relevant tissues (Supplementary Table 2). These findings highlight that a lack of *cis*-acting regulation of a disease gene within the known disease tissue may not be uncommon, emphasizing the importance of trans-acting eQTLs, particularly when looking at complex traits and diseases.<sup>44</sup>

#### Conclusion

This work provides a new perspective on the genetic etiology of PD, expanding the role of GBA from the gene encoding the GCase to that of a central regulator and modifier of PD onset, with GBA expression itself subject to distant regulation. Although extrapolating changes in GBA expression to the activity of the encoded GCase is challenging, it remains likely that the regulatory changes we have identified contribute to alterations in the activity of the GCase and other enzymes in the brain and peripheral tissues. It is notable that the distant genes that are connected to GBA are enriched for LoF intolerance and therefore can only be subject to regulatory changes at the gene or protein levels. This provides a plausible explanation for the variable phenotypes observed in GBA centric Gaucher disease, PDD, and DLB. Empirical studies are still required to functionally validate the regulatory regions, enabling quantification of their regulatory effect. Once validated, variants may be used for disease stratification, leading to personalized drug selection and the possible development or repurposing of novel drugs.

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## Supporting Data

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